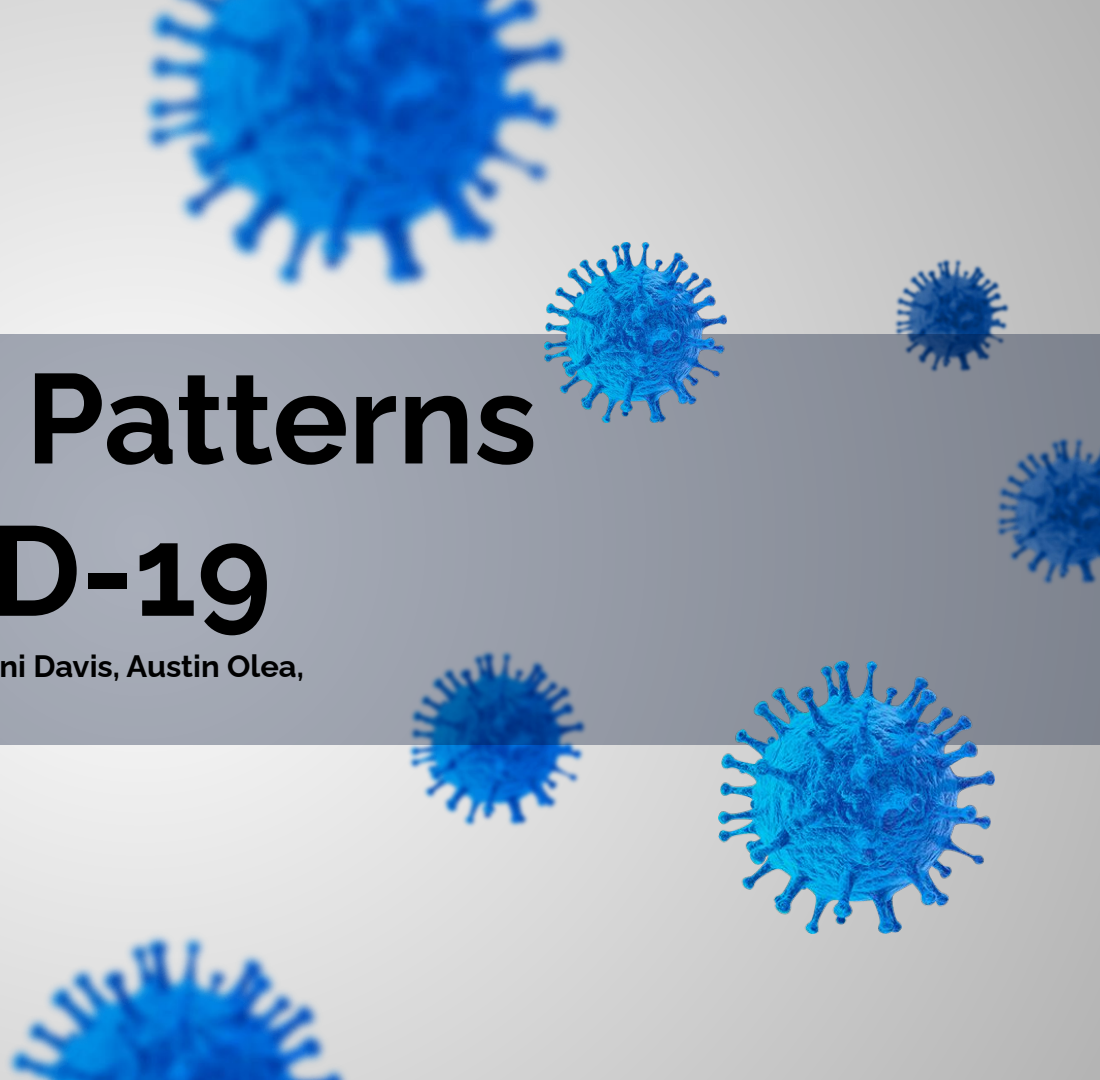


# Home Value Patterns Due to COVID-19

Data Analytics by: Jason Sheridan, Anna Sours, Jenni Davis, Austin Olea,  
& Mark Blankenship



# Hypothesis

Where COVID-19 cases are higher in counties with major cities, home values will increase in the surrounding counties.



# Questions:

- How are people migrating throughout the US since COVID 19 began?
- Has this impacted home values?
- Is there a relationship between cases and the housing market?

# Data Sources:

## COVID-19 Cases:

- NY Times US states & counties
  - Texts files with state, county, date, cases, etc.
- US census data
  - Shapefiles
- API calls
  - Coordinates
- New dependencies for mapping
  - geopandas
  - folium

## Home values:

- Zillow Home Value Index (ZHVI) from [zillow.com](https://www.zillow.com/hvi/)
  - CSV files updated monthly
  - ZHVI values for Metro & U.S.
  - Monthly values from 1/31/1996 - 12/31/2020

# COVID-19 Data Exploration

## Analysis 1:

- NY Times US states & counties
  - **Q: What states have the highest count of COVID-19 cases? And of those states, which counties had the highest count of COVID-19 cases?**

## Exploration & Data Wrangling:

- NY Times data
  - US states & counties data - date, state, county, cases, etc.

### Methods:

- ➔ Filtering
- ➔ Grouping
- ➔ Stats
- ➔ Dropping values
- ➔ Sorting values
- ➔ Horizontal bar chart

### Analysis 1: NYTimes Data

```
1 # Store filepath in a variable
2 file_one = "output_data/us-states.txt"
3 us_states = pd.read_csv(file_one)
4 file_two = "output_data/us-counties.txt"
5 us_counties = pd.read_csv(file_two)

1 #Use groupby method to isolate states
2 grouped = us_states.groupby(['state'])

1 #Calculate maximum number of cases
2 max_cases = grouped['cases'].max()

1 #Create a data frame
2 remove Terr = pd.DataFrame(max_cases)
3
4 #Remove US territories
5 fifty_states = remove_Terr.drop(['Guam', 'Puerto Rico', 'Northern Mariana'])

1 #Sort cases by highest to lowest number by state
2 fifty_states = fifty_states.sort_values(['cases'], ascending=False)

1 #Create a bar chart to find top three states with highest amount of cases
2 panda_chart = fifty_states.plot(kind='barh', figsize=(15, 10))
3 panda_chart.set_xlabel("Total Number")
4 panda_chart.set_ylabel("States")
5 plt.title("States and Maximum Cases")
6 # plt.tight_layout()
7 plt.show()
```

# COVID-19 Data Exploration

## Analysis 2:

- API calls, US census data & geopandas
  - **Q: Can we take the NYTimes data and layer it onto a map of the United States and have it display state name and maximum case counts?**

## Exploration & Data Wrangling:

- API calls
  - Coordinates
- US census data
  - Shapefiles
- Geopandas

## Methods:

- ➔ API calls ☹️
- ➔ Shapefiles
- ➔ Export/Import csv files
- ➔ More: filtering, grouping, dropping
- ➔ Adding/rename columns
- ➔ Merging

Analysis 2: API calls for coordinates

Analysis 3: Shapefiles & geopandas

```
In [2]: # List for holding lat_lngs and list of cities to be found
lat_lngs = []
cities = ['Los Angeles', 'Riverside', 'Victorville', 'Bakersfield', 'Cartago', 'Thousand Oaks', 'Irvine', 'Escondido',
          'Brawley', 'Houston', 'Conroe', 'Dayton', 'Beach City', 'League City', 'Angleton', 'Rosenberg', 'Hempstead',
          'Dallas', 'Fort Worth', 'Weatherford', 'Decatur', 'Denton', 'McKinney', 'Cleburne', 'Palmer', 'Terrell', 'Rockwall',
          'Miami', 'Davie', 'West Palm Beach', 'Key West', 'Golden Gate', 'Fort Myers', 'Clewiston', 'Buckhead Ridge',
          'Taylor Creek', 'Palm City']

# Create a set of random lat and lng combinations
lats = np.random.uniform(lat_range[0], lat_range[1], size=40)
lngs = np.random.uniform(lng_range[0], lng_range[1], size=40)
lat_lngs = zip(lats, lngs)

# Identify city for each lat, lng combination
for lat_lng in lat_lngs:
    city = citipy.nearest_city(lat_lng[0], lat_lng[1]).city_name

# Print the city count to confirm sufficient count
len(cities)
```

```
1 #Read into shapefile from US census data
2 file_path = "mapping/us_nation/cb_2018_us_state_20m.shp"
3 usa_map = gpd.read_file(file_path)
4 # type(usa_map)
```

# Maximum COVID-19 Cases per State (showing lower forty-eight)

States determined for further analysis:

- California
- Texas
- Florida

- California
- Texas
- Florida

- California
- Texas
- Florida



# COVID-19 Data Exploration

## Analysis 3:

- More mapping...?
  - **Q: Can we use heat maps and markers to better highlight the counties with maximum cases and their surrounding counties?**

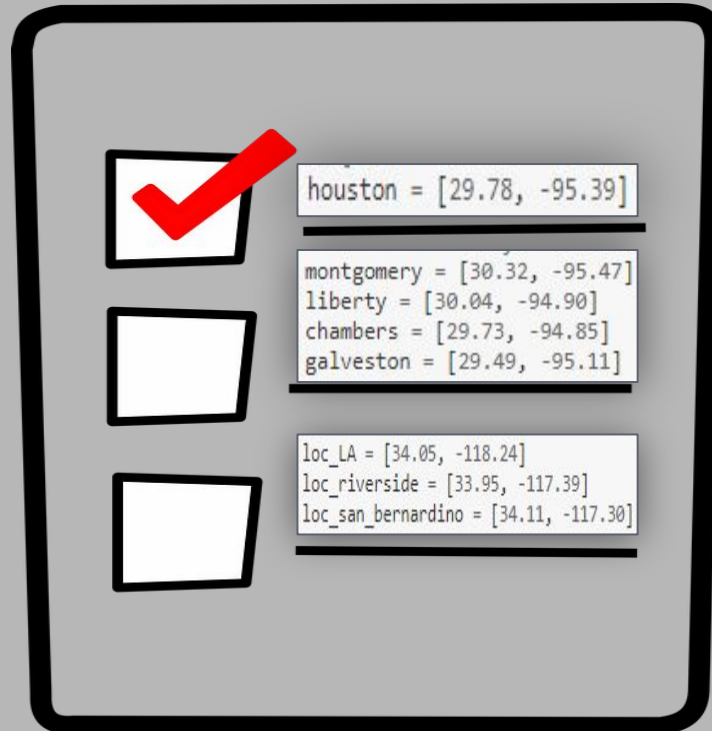
## Exploration & Data Wrangling:

- Folium
  - Mapping library

### Methods:

- **Gmaps**
- **Heatmaps**
- **Folium**
- **Lists...**
- **Lists of coordinates...**
- **Lists of cities...**
- **LISTS!**

Analysis 4: County maps



A map of the Dallas Metro area in Texas, showing major highways and cities. The map is titled "Texas - Dallas Metro". Two large blue circles highlight the Fort Worth and Dallas metropolitan areas. Various cities are labeled, including Sanger, Anna, Melissa, Prosper, Frisco, McKinney, Farmersville, Denton, Corinth, Lewisville, The Colony, Allen, Wylie, Rockwall, Royse City, Terrell, Kaufman, Ennis, Waxahachie, Midlothian, Venus, Grandview, Cleburne, Mansfield, Burleson, Crowley, Forest Hill, Benbrook, Arlington, Irving, University Park, Mesquite, Balch Springs, Heartland, Crandall, Lancaster, Cedar Hill, Duncanville, Garland, Carrollton, Grapevine, Keller, North Richland Hills, Azle, Weatherford, Granbury, Bridgeport, Decatur, and Sanger. The map also shows major highways like I-35, I-40, I-75, and I-820.

**County Maps**



# Home Value Data:

- **Q: What are home values in areas with highest count of COVID-19 cases?**
  - ZHVI reflects typical value and market changes for homes in the 35th to 65th percentile range in a given region
  - Narrowed down data to relevant years: 2017-2020
  - Dropped null values from numerical columns
  - No duplicate county names
  - Exported to CSV for use with analysis

```
In [158]: 1 # Read raw data
          2
          3 file_path = "zillow_data/zhvi_data/County_zhvi_uc_sfcrondo_tier_0.33_0.67_sm_sa_mon.csv"
          4 home_values_df=pd.read_csv(file_path)
          5
          6 home_values_df.head()

Out[158]:
```

	RegionID	SizeRank	RegionName	RegionType	StateName	State	Metro	StateCodeFIPS	MunicipalCodeFIPS	1996-01-31	...	2020-03-31	2020-04-30	2020-05-31
0	3101	0	Los Angeles County	County	CA	CA	Los Angeles-Long Beach-Anaheim	6	37	177774.0	...	659773.0	664580.0	666444.0
1	139	1	Cook County	County	IL	IL	Chicago-Naperville-Elgin	17	31	154331.0	...	253684.0	254076.0	254595.0
2	1090	2	Harris County	County	TX	TX	Houston-The Woodlands-Sugar Land	48	201	99675.0	...	199807.0	200940.0	201912.0
3	2402	3	Maricopa County	County	AZ	AZ	Phoenix-Mesa-Scottsdale	4	13	116247.0	...	299209.0	302766.0	305996.0
4	2841	4	San Diego County	County	CA	CA	San Diego-Carlsbad	6	73	180788.0	...	615413.0	618539.0	622620.0

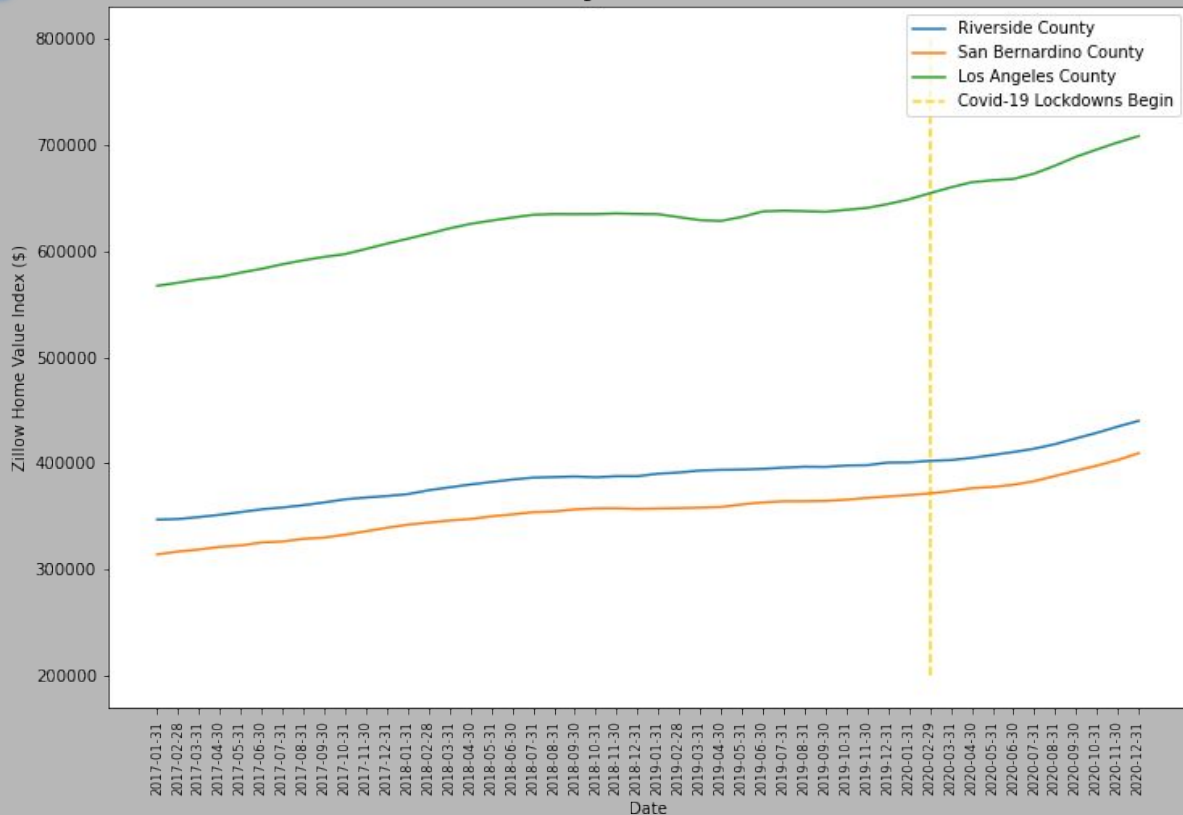
5 rows x 309 columns

	RegionName	RegionType	State	Metro	StateCodeFIPS	MunicipalCodeFIPS	2017-01-31	2017-02-28	2017-03-31	2017-04-30	...	2020-03-31	2020-04-30	2020-05-31
0	Los Angeles County	County	CA	Los Angeles-Long Beach-Anaheim	6	37	567167.0	570020.0	573344.0	575480.0	...	659773.0	664580.0	666444.0
1	Cook County	County	IL	Chicago-Naperville-Elgin	17	31	235165.0	235814.0	237493.0	238830.0	...	253684.0	254076.0	254595.0
2	Harris County	County	TX	Houston-The Woodlands-Sugar Land	48	201	177989.0	178366.0	178869.0	179782.0	...	199807.0	200940.0	201912.0
3	Maricopa County	County	AZ	Phoenix-Mesa-Scottsdale	4	13	242028.0	243189.0	244568.0	245814.0	...	299209.0	302766.0	305996.0
4	San Diego County	County	CA	San Diego-Carlsbad	6	73	528758.0	531624.0	536251.0	542424.0	...	615413.0	618539.0	622620.0

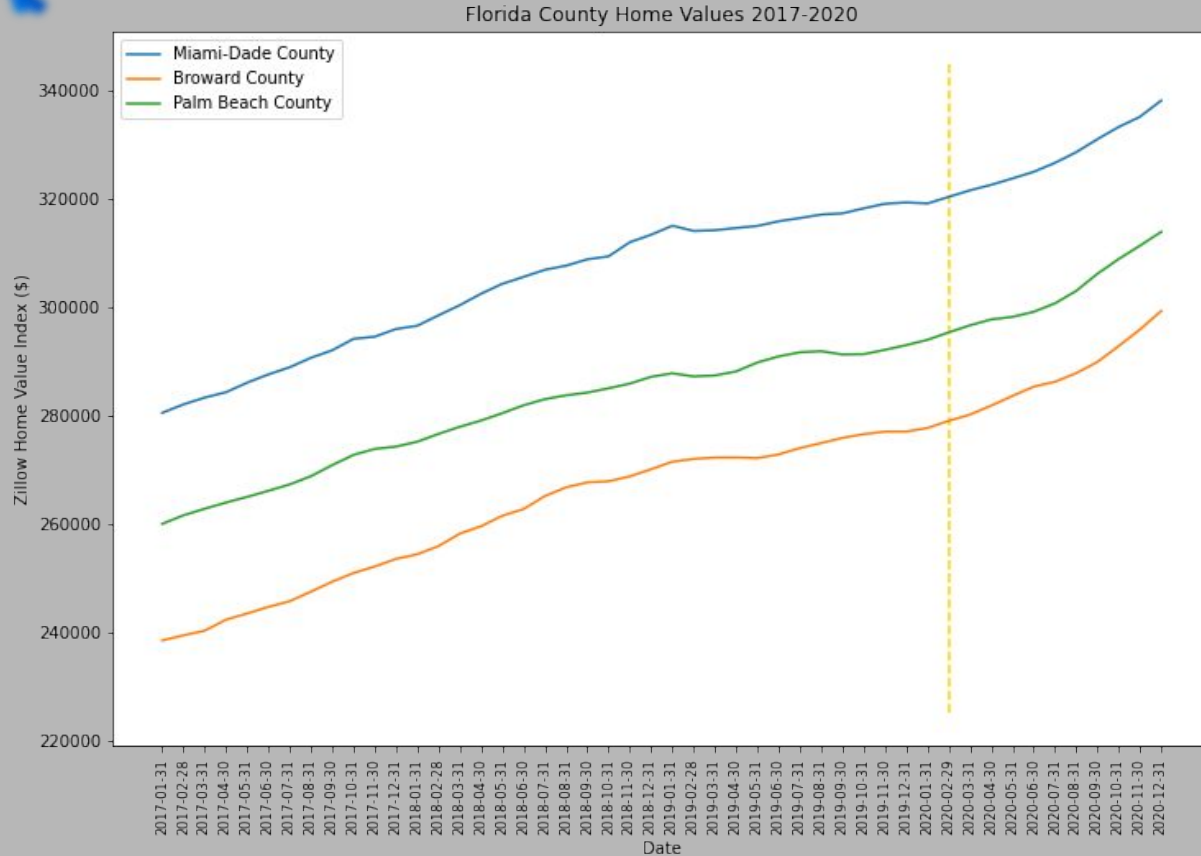
5 rows x 54 columns

# Home Value by County: California

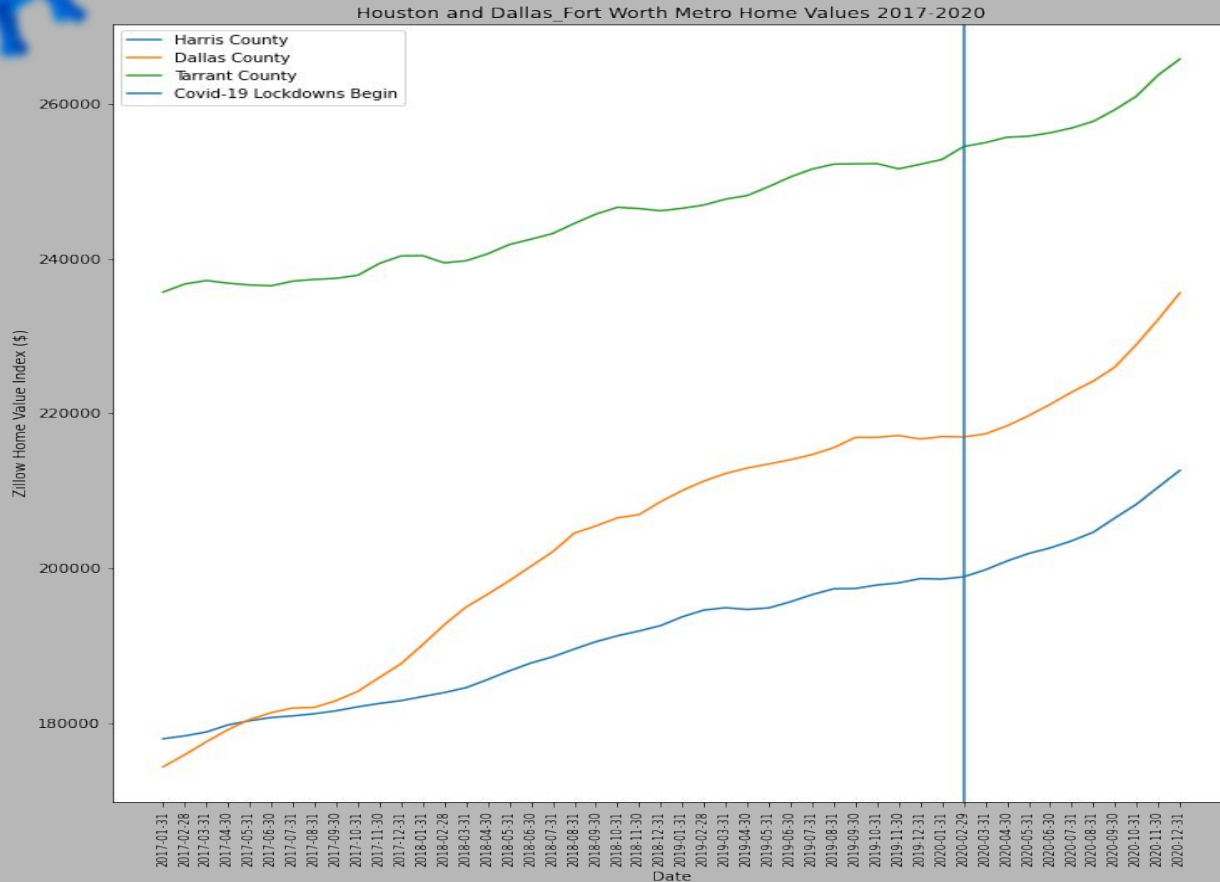
California Counties with High Covid Rates Home Values 2017-2020



# Home Value by County: Florida



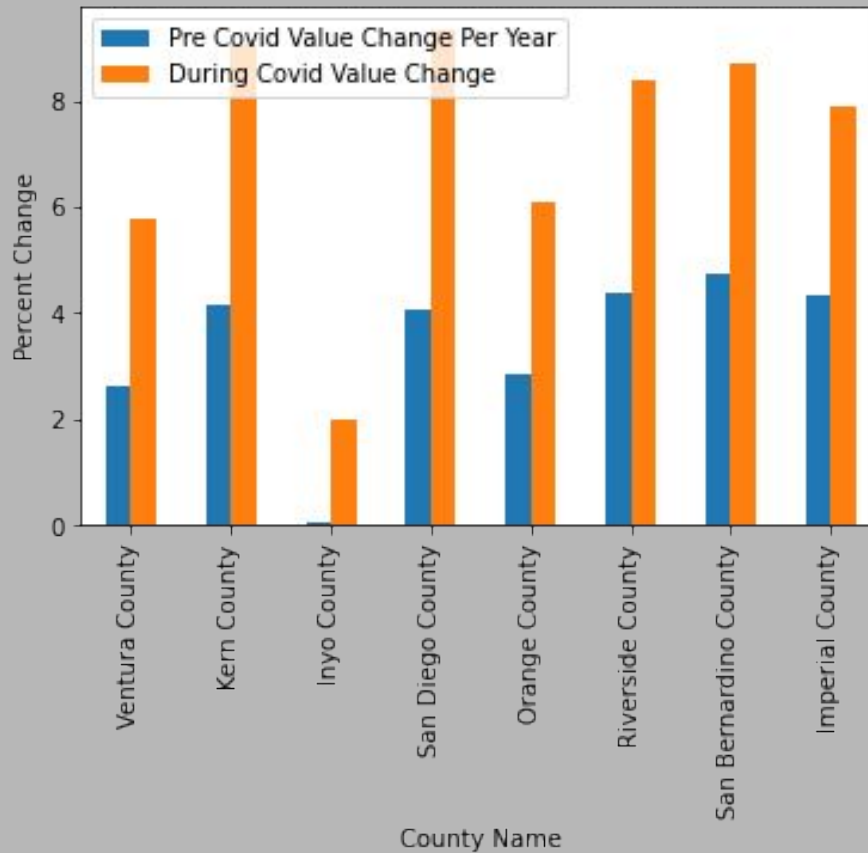
# Home Value by County: Texas





# Home Value by County: California

Los Angeles Metro County Home Values Percent Change Over Time



```
▶ tx_percent_cols=tx_df[['RegionName','2017-03-31','2020-02-29','2020-03-31','2020-12-31']]
Dallas_counties=["Dallas County","Tarrant County","Denton County","Collin County","Rockwall County","Hunt County","Kauf
pre_covid_dfw=[]
covid_dfw=[]

for each_county in Dallas_counties:

    tx_cnt_filter=tx_percent_cols['RegionName']==each_county #just change county name and run cell

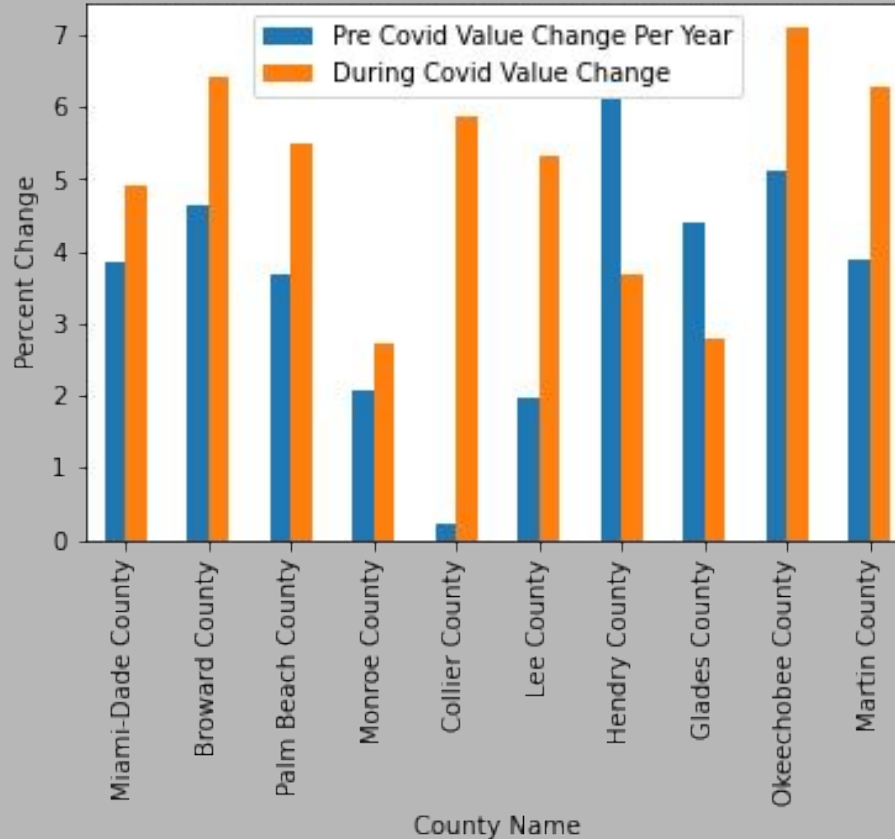
    mar2017=tx_percent_cols.loc[tx_cnt_filter,'2017-03-31']
    feb2020=tx_percent_cols.loc[tx_cnt_filter,'2020-02-29']
    mar2020=tx_percent_cols.loc[tx_cnt_filter,'2020-03-31']
    dec2020=tx_percent_cols.loc[tx_cnt_filter,'2020-12-31']

    pre_covid_annual=((((feb2020-mar2017)/feb2020)/3)*100).values[0]
    covid_annual=((((dec2020-mar2020)/dec2020)*100).values[0])

    pre_covid_dfw.append(pre_covid_annual)
    covid_dfw.append(covid_annual)
```

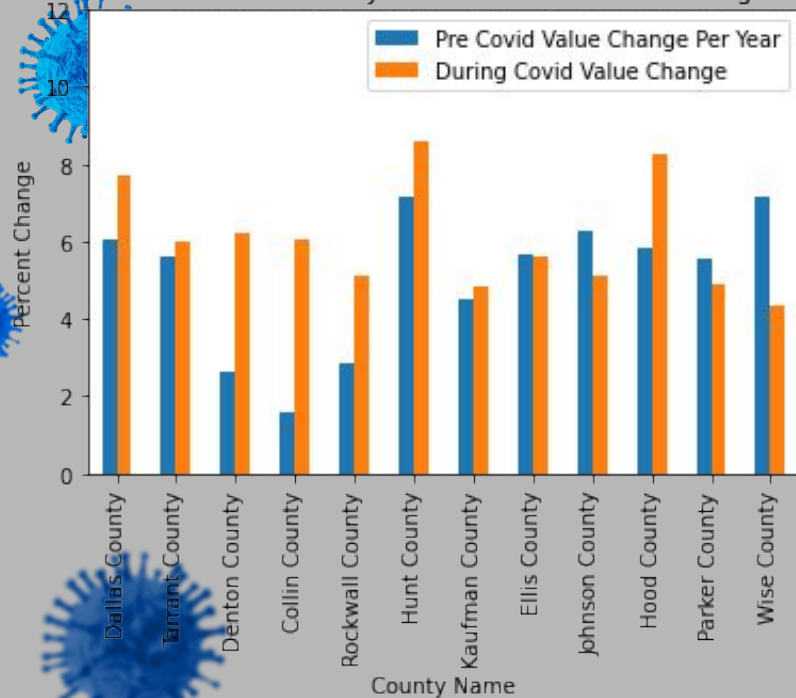
# Home Value by County: Florida

Miami Metro County Home Values Percent Change Over Time

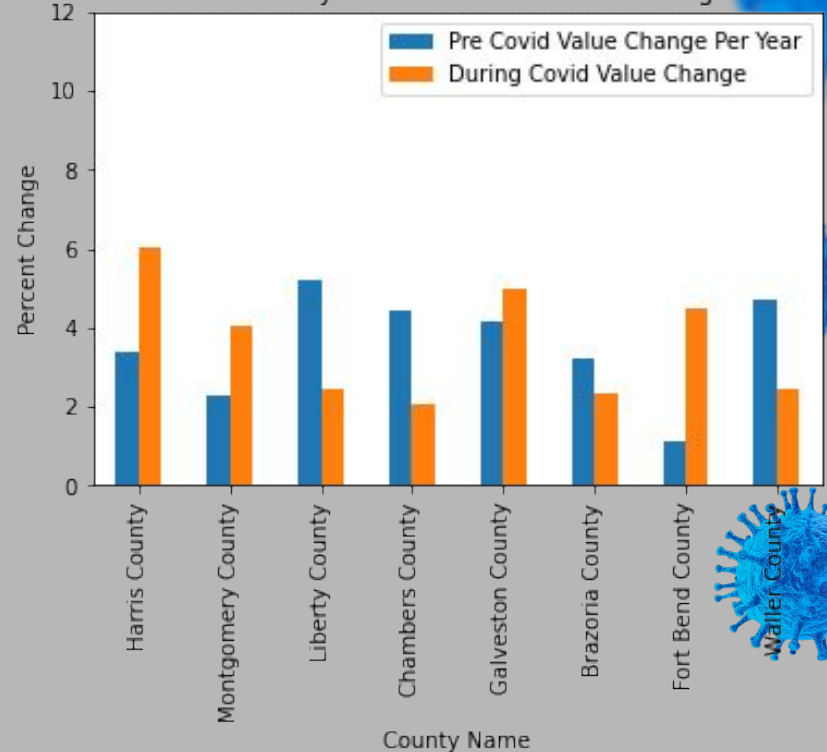


# Home Value By County: Texas

Dallas-Fort Worth Metro County Home Values Percent Change Over Time



Houston Metro County Home Values Percent Change Over Time





# Conclusion Summary

- In the majority of the metro-area counties analyzed, home values increased at a greater rate in 2020 than the average rate from 2017-2019. It also appears that values increased at a proportionally higher level in areas with lower COVID-19 cases.

# Implications of findings

## What does our conclusion mean?

- According to these metrics, in most areas, we found increased home values in counties surrounding cities with highest COVID-19 cases. This could be due to a desire to leave more densely populated areas, away from areas with higher COVID cases.

## What are next steps/further analysis?

- Analyze data from counties with major cities with fewer COVID-19 cases
- Analyze housing values against other market factors to further understand the impact of COVID-19
- Analyze type and size of home purchased against the type of home sold by a particular buyer

# Q&A

